



# Richard W. Hamming

## Learning to Learn

The Art of Doing Science and Engineering

## Session 11: Coding Theory II



# Coding Theory II Overview

## Two types of Coding

- Source Encoding
- Channel Encoding

## How do we find the best source encoding?

- Huffman encoding

## How do we encode for a noisy channel?

- Error correcting codes



# The Best Source Encoding

We know efficient codes are related to probabilities.

Intuition leads to the solution:

$$p_1 \geq p_2 \geq p_3 \dots \geq p_n$$

$$l_1 \leq l_2 \leq l_3 \dots \leq l_n$$

Prove this by exchanging any two lengths and the average code length decreases.

# Deriving Huffman Encoding

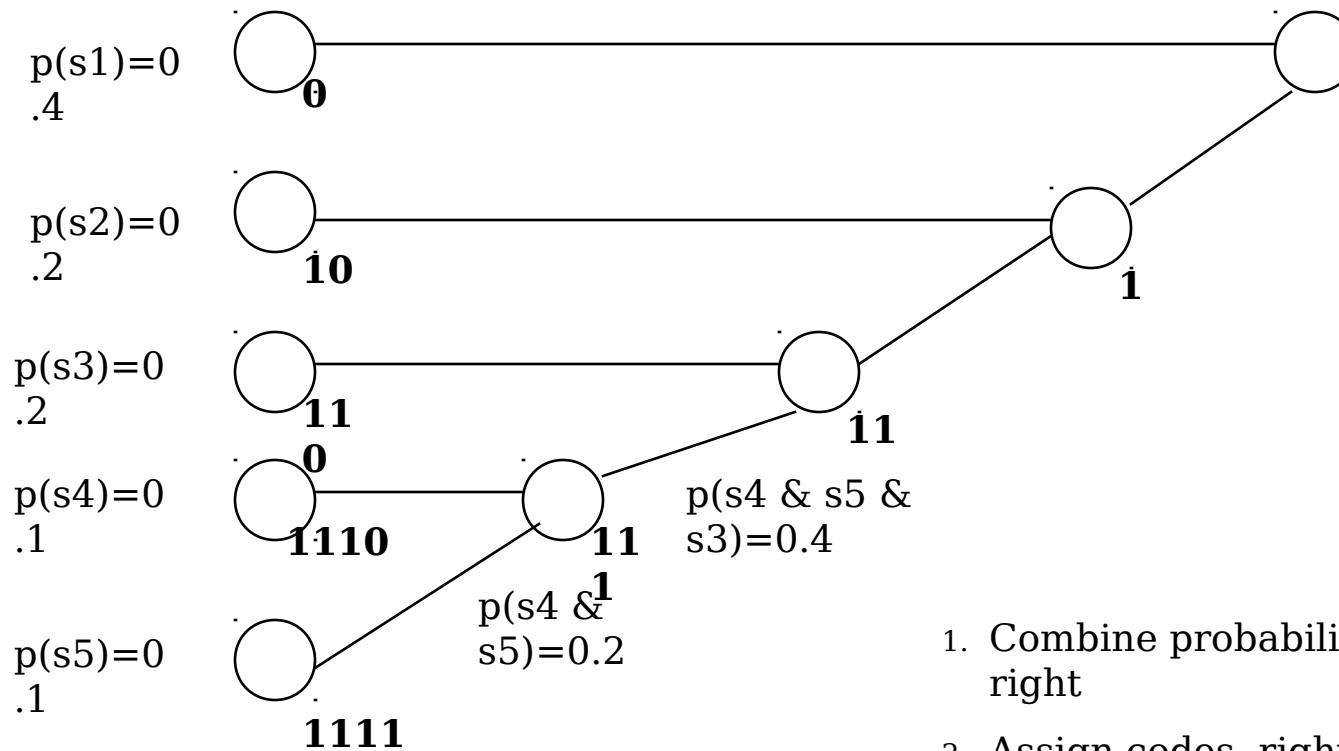


**Create the best encoding of symbols from their probabilities.**

**Build encoding tree from bottom up.**

- Merge 2 least frequent nodes, combine their probabilities, repeat.
- Assign 0,1 to final 2 symbols.
- Back down the tree, split symbols, assigning 0 or 1 appended to parent's code.

# Deriving Huffman Encoding Tree (Visual)



1. Combine probabilities, left to right
2. Assign codes, right to left.



# Optimality

**Huffman trees give optimal (most efficient) codes.**

**Do we necessarily want optimal?**

**What characteristics do we want?**

- Efficiency (average code length)?
- Efficiency and low variability?

**Start from an optimum and move one way or the other.**

- Sometimes you can get a large change a desired characteristic but pay little in performance.



# Why Huffman?

**Write a program to do it.**

**Sending Huffman tree and encoded info saves channel or storage capacity.**

**Best possible data compression.**

- If anything can be gained by compression.
- With uniform distribution, thus block code, no compression possible.



# Channel Encoding

## What to do with noise?

- Error detection

**Extra parity bit catches only 1 error.**

**Probability of 2 errors in a message of length  $n$  increases with  $n$ .**

- In a longer message parity bit takes up less channel capacity.
- In a longer message 2<sup>nd</sup> error more likely.
- Depends on probability  $p$  of error in a single bit.



# Errors

**Probability of 2,3,4, and higher errors depends mostly on  $np$  product.**

- $np$  near 1 makes errors highly likely.
- Very small  $np$  makes double, triple errors highly unlikely.

**Tradeoff between error and efficiency.**

**Engineering judgment that requires a concrete case and a real  $n$  and  $p$ .**



# Error Handling

**What if an error occurs?**

**Repeat the message**

- On marginal errors repeat messages will be clear
- On systematic errors you will repeat error until you get a double error. Not a good strategy.

**Strategy depends on the nature of the errors you expect.**



# Detecting Human Error

**Encoding alphanumeric symbols.**

**Humans make different types of errors than machines**

- Changing one digit: 667 to 677
- Exchanging digits: 67 to 76
- Parity can't cope with the two digit exchange error



# Detecting Human Errors

## Weighted code

- Add 1 parity symbol to a message of length  $n-1$  so the message checksum below is 0.

$x_k$  is the value for the  $k^{th}$  symbol of the message,  $0 \leq x_k \leq 36$

$$\left\lfloor \sum_{k=1}^n k \cdot x_k \right\rfloor \bmod 7$$



# Different Types of Codes

**ISBN is a weighted code with modulo 11.**

**Even/odd parity bit is for white noise**

**Weighted code is for human noise.**

- But machine can easily check code for mistake

**Many types of codes not talked about.**

**Know what the noise is to determine type of code.**

**Design a code to meet the cope with your particular type of noise problem.**



# Creativity in Deriving Codes

**Learn principles, then solve your problem.**

**Next lecture will tell how Hamming derived his codes.**

**If you were in the same situation Huffman or Hamming were in, could you come up with the codes if you had to?**

**Creativity is simple if you are prepared.**



# Parting Thoughts

**Many scientists wasted the second half of their lives elaborating a famous theory.**

- Leave elaborations to others.
- Follows from Hamming's earlier statement, that those who come up with great ideas often don't understand their own ideas as well as do those who follow.

**Set great work aside, try to do something else.**